



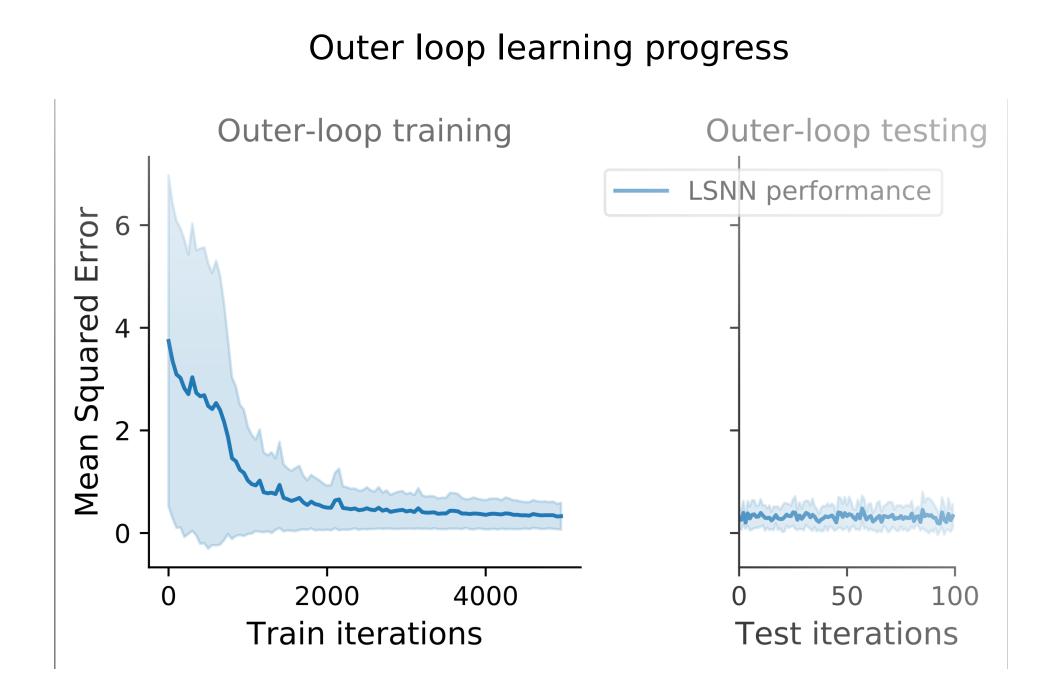




### Examples

## L2L can engrave priors in Recurrent Spiking Neural Networks (RSNNs)

- Optimizer: Back propagation through time (BPTT)
- Outer loop family of tasks: Sinusoids with different amplitudes and phases
- After outer loop training, the RSNN has a prior of sinusoidal functions



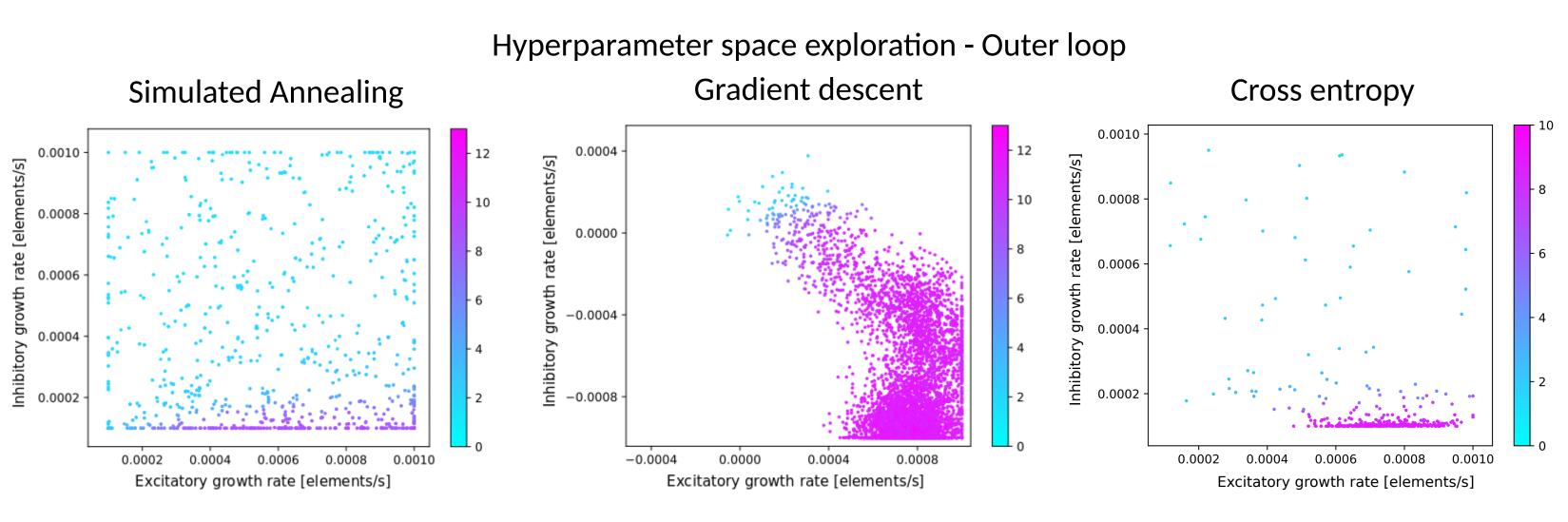
[Bellec, Salaj, Subramoney et al. NeurIPS 2018]

# Inner loop learning progress (network internal models) Step 0 Step 1 Network prediction Presented examples Step 7

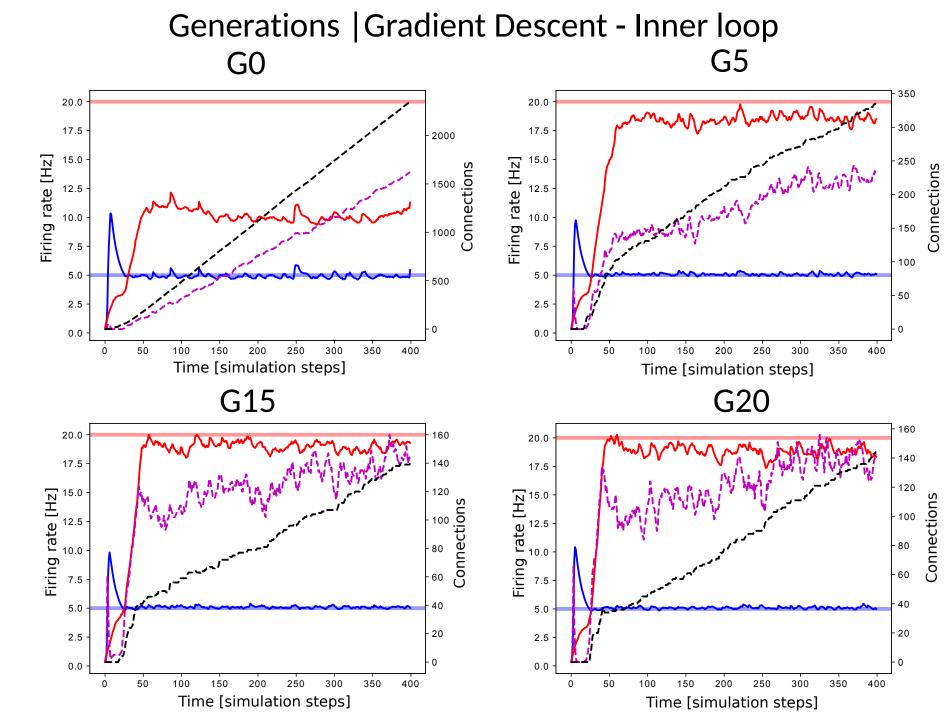
# L2L and structural plasticity

- Optimizers: Simulated annealing, gradient descent, cross entropy
- Outer loop family of tasks: Different target average firing rate per population
- Individual instances of networks 80% excitatory and 20% inhibitory in NEST[4] are parallelized with NEST. Networks are initialized without connections and structural plasticity is used to achieve the desired target average firing rate per population inner loop

 Multiple independent instances are launched on JURECA and the hyperparameters of structural plasticity are optimized - outer loop

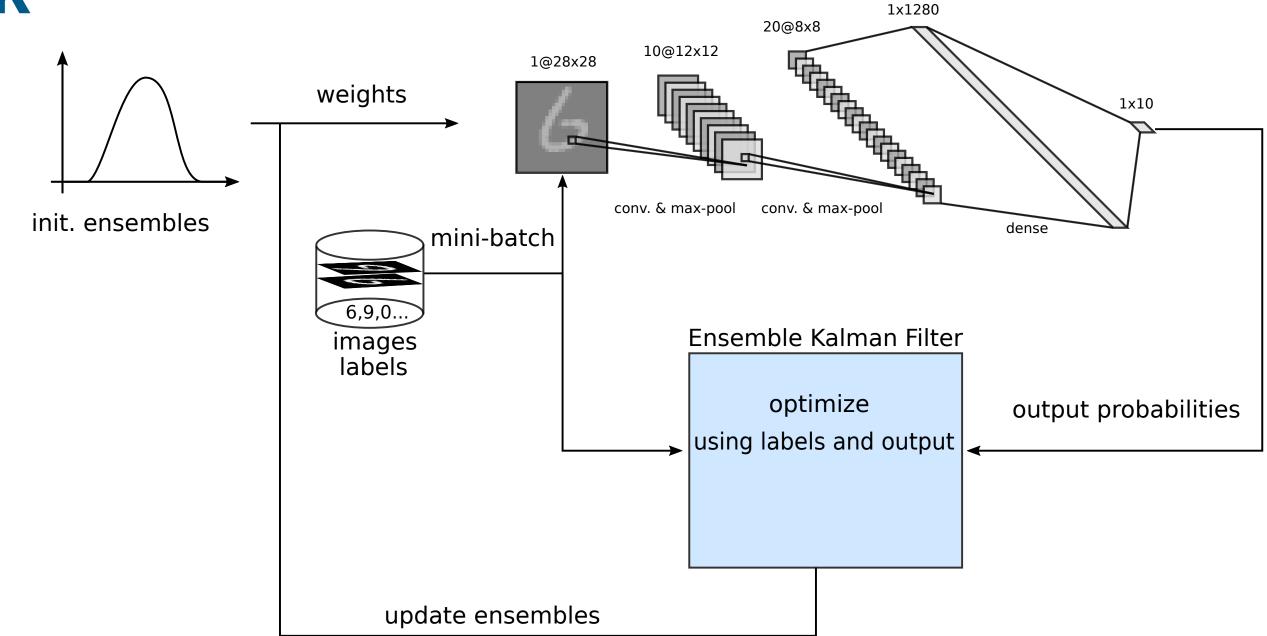


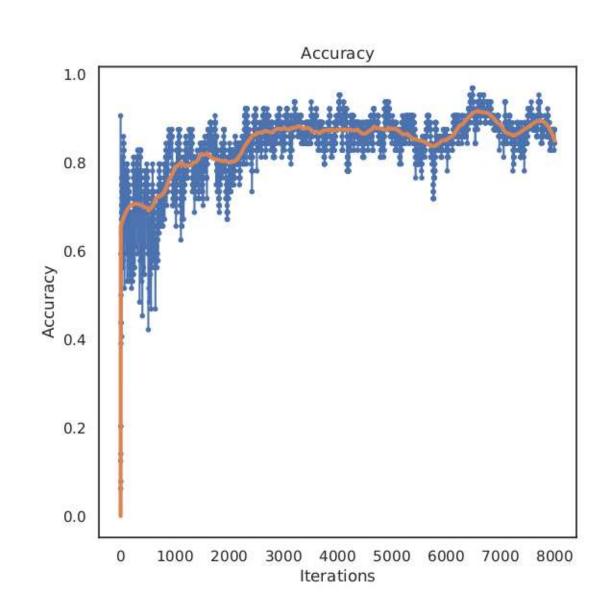
[Diaz et. al. 2019]



# Optimizing a Neural Network

- Optimizer: Ensemble Kalman filter [3]
- Outer loop family of tasks: MNIST
- Updating the weights of an artificial neural network (e.g. Convolutional Network) requires only the evaluation of the forward propagation (no backprop)





### Outlook

- Development and benchmarking of other optimizers for biological and artificial neural networks
- Better support for real time closed-loop learning setups
- Supporting very long training (weeks months)

### References

- [1] Brenden M. Lake, Tomer D. Ullman, Joschua B. Tannenbaum, and Samuel J. Gershman. "Building machines that learn and think like people". Behavioral and Brain Sciences 40 (2017)
- [2] Sebastian Thrun and Lorien Pratt. learning to learn. Springer Science & Business Media, 2012.
- [3] Iglesias, Marco A., Kody JH Law, and Andrew M. Stuart. "Ensemble Kalman methods for inverse problems". Inverse Problems 29.4 (2013):045001
- [4] Linssen, Charl et al. (2018) NEST 2.16.0. Zenodo. 10.5281/zenodo.1400175